



# Trends in global inequality using a new integrated dataset

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# Global inequality: literature

- Trends (mainly Gini using hh surveys): **increase + mixed + decline**
  - **Anand and Segal** (2008), 8 studies 2002-06:
    - Increase before 1970/80 + mixed 1980-90/95 + decline 1990-2000.
  - **Bourguignon and Morrisson** (2002); **Bourguignon** (2015, 2019):
    - Long-term increasing inequality until 1980 + stagnation 1980-90 + decline afterwards.
  - **Lakner and Milanovic** (2016); **World Bank** (2016), **Milanovic** (2021):
    - Decline 1988-2008-2013.

# Global inequality: sensitivity

- Limited robustness to some other inequality indices, reflecting a different **distributive sensitivity** (Lakner and Milanovic, 2016; Bourguignon, 2015).
- Inequality is higher and the trend may be different after correcting for **incomes at the top**:
  - Survey data: Lakner and Milanovic (2016); Milanovic (2021); Jordá and Niño-Zarazúa (2019).
  - Mixed data, WID: WIL (2018, 2021), Chancel and Piketty (2021).
- Strongly sensitive to adopting an **absolute inequality** approach (Ravallion 2004, 2018, 2021; Niño-Zarazúa et al. 2017).



# Contribution

- **New integrated standardized dataset** on global inequality:
  - Percentile level, with annual information since 1950.
  - Based on HH surveys: (companion dataset of the) **World Income Inequality Database (WIID)**.
- **Broad overview** of trends in global inequality:
  - more detailed, systematic,
  - and comprehensive analysis (overall and between/within-country).

# Contribution

- **Consistent** with previous literature (survey data) but significantly improving **time and geographical coverage**.
  - Entire **distribution** → sensitivity analysis to **different inequality approaches**:
    - **Absolute** and **relative** inequality.
    - **Distributive pattern** (i.e., focus on the bottom, middle, or top).
    - No correction so far, but allows for studying the impact of correcting **top incomes** [**robustness**]
- Quantifying the **contribution of countries** to trends (overall and its components).

# World Income Inequality Database (WIID)

- At **UNU-WIDER** since 2000 (← **Deininger and Squire 1996**), regularly updated.
  - Widely used to analyze **Global Inequality**.
- **Sources:** PovcalNet (now PIP), LIS, Eurostat, SEDLAC, ECLAC, UNICEF, OECD, other IO, NSA, research studies, earliest compilations.
  - Scattered information for **200 entities** presented in an organized way.
    - **Gini + shares** (D, Q, b/t 5%), mean, median.
    - + **other indices** recently added: Entropy, Atkinson, Palma, S80S20.
- **Rich** information (20k+ data points): Multiple and heterogeneous **options** per country/year (measure of resources, equivalence scale, source, ...).

# WIID Companion: Within-country distribution

- **Selection** of ‘best’ country series (referred to various sources and welfare concepts).
  - Priority to LIS, Eurostat, ECLAC/SEDLAC;
  - As well as to national-level, per capita net income, ...
- Estimation of **percentile distribution** from available aggregate income shares (D, Q, bottom/top 5% → Shorrocks and Wan 2009 algorithm).

# WIID Companion: Within-country distribution

- **Integration and Standardization** of various series into one new single series of the distribution of **national net income per capita**.
  - Integrated series: Chaining **overlapping** percentile series within countries.
  - Standardizing by exploiting existing **empirical relationship** among the income distribution of different welfare concepts in the LIS sample.
    - Adjustment based on info from same country or similar (same country global region/ country income group)
- Several **relative and absolute inequality measures**.



# WIID Companion: Global distribution

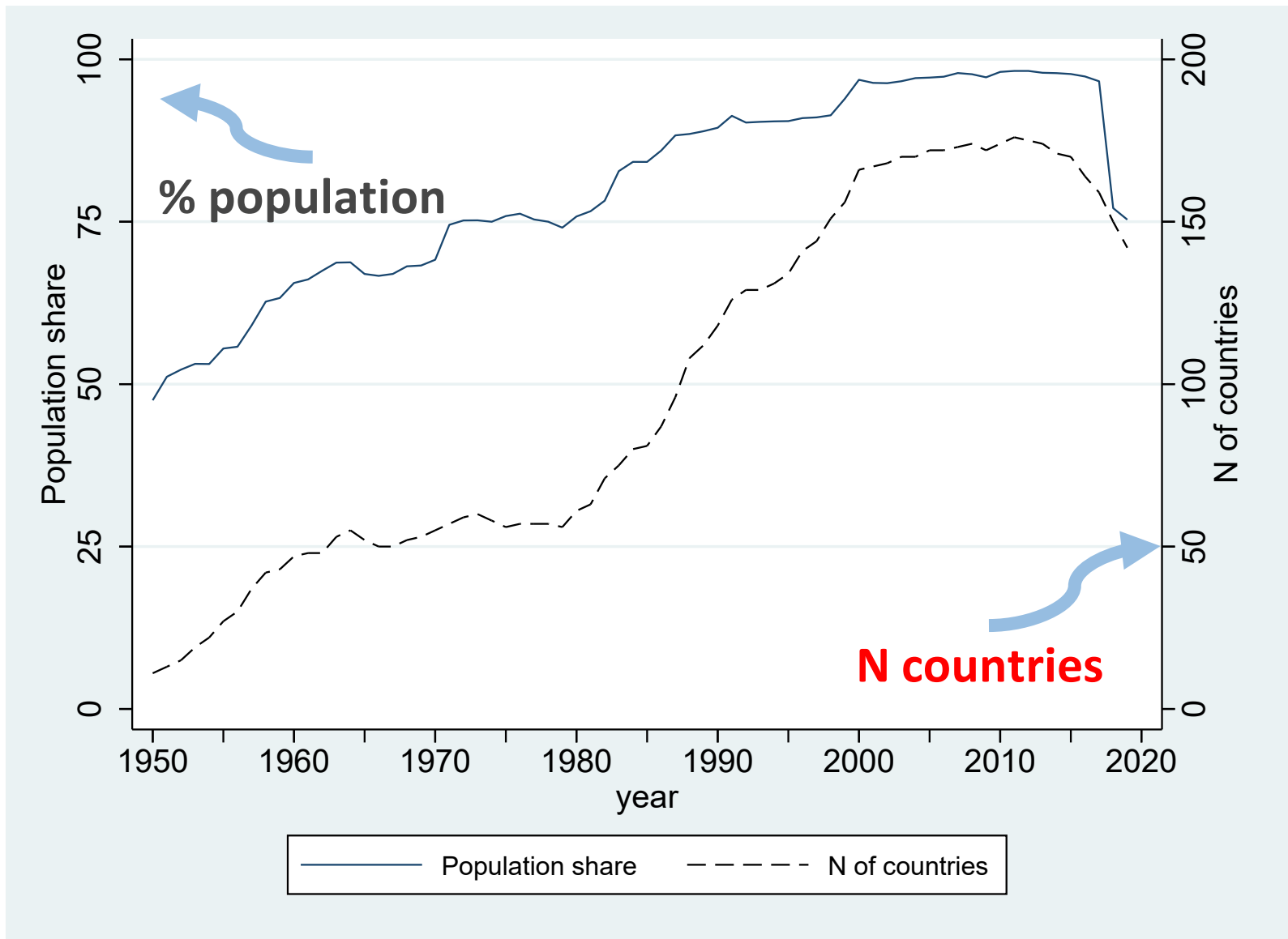
- **Balanced panel of all countries** (defined as they exist today, 193 UN countries + 16 territories)
- From **1950 to 2020** (→ additional annual updates).
- Country per capita income: **GDP 2017 US PPP**
  - WDI (WB) + Maddison project + PWT [**robustness**]
  - IMF GDP 2021 projections

# WIID Companion: Global distribution

- Completing missing **country/year** observations with:
  - Interpolation** between survey years,
  - Extrapolation** (constant distribution) before first/after last survey
  - + a few **imputations** (Libya, Qatar, Saudi Arabia, and microstates)
- **World and regional percentile distribution**
  - several relative and absolute inequality **measures** and income share **ratios**.

# N of countries and population share

with a survey in each bin year using a +/-5-year bandwidth



Higher density of surveys **after 1980s/1990s: 1 survey falling at most 5 years away** from the target year for **50+% of world population since 1950**, near 100% in 2000s (falling at the end, e.g., India).

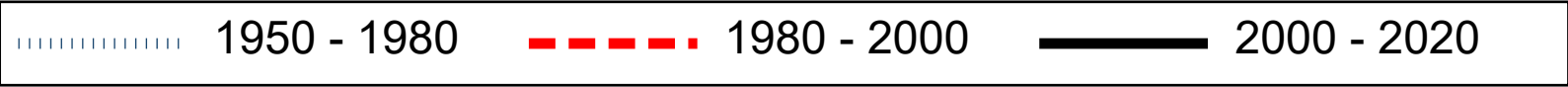
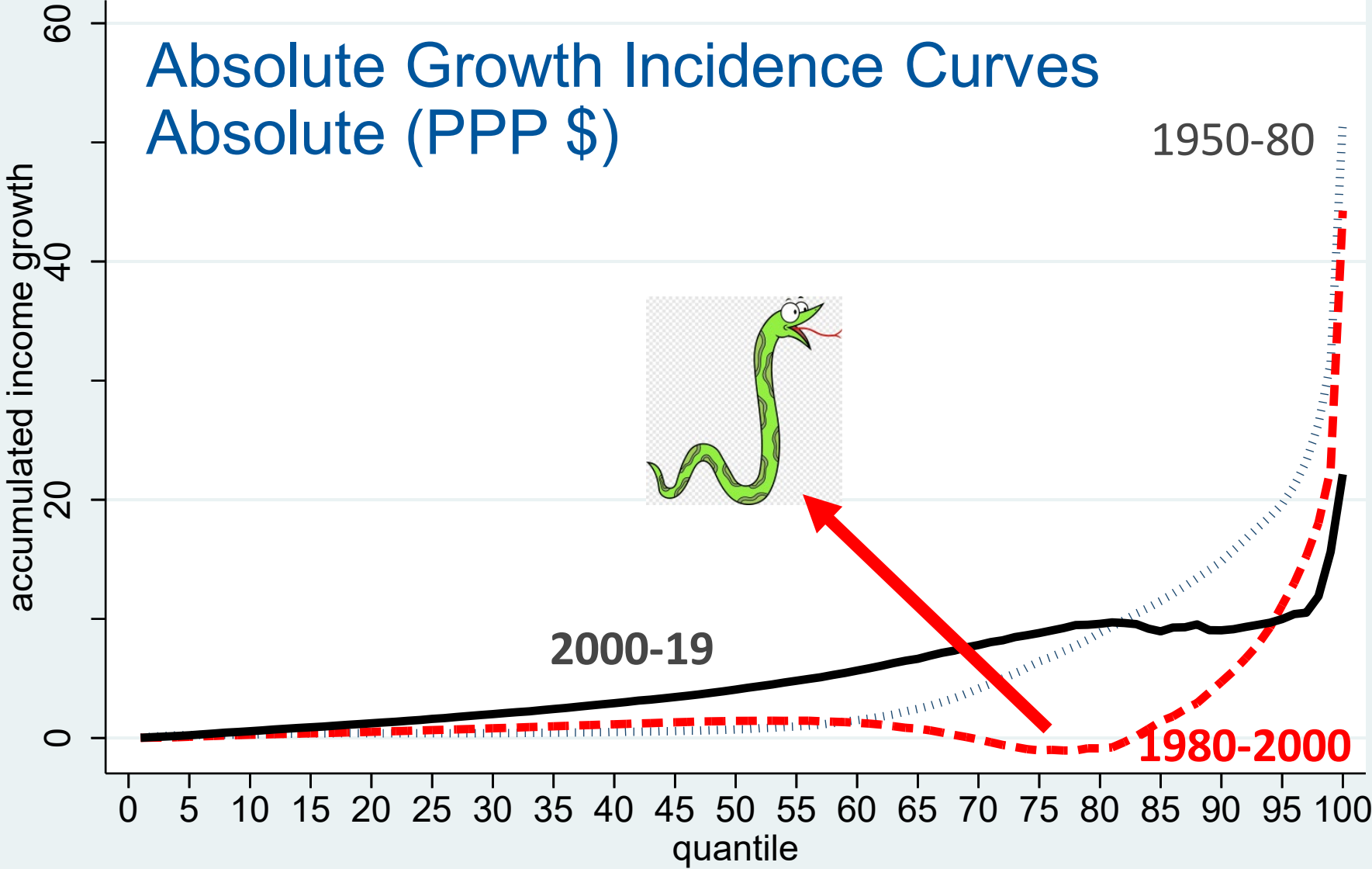
# WIID Companion Datasets

- **Open access:** [www.wider.unu.edu/wiid](http://www.wider.unu.edu/wiid) (current version: 30 June 2022, update soon)
- **Transparent:** fully documented
  - **Technical notes** describing the construction.
  - **Replicable** from original WIID (Stata codes + auxiliary datasets).
  - All country/year observations are **traceable**:
    - **Type**: survey, interpolated, extrapolated, imputed.
    - Original **characteristics**: source, resources, equivalence scale, coverage, survey, ...

# Trend in absolute inequality

- ***Translation invariance***: larger **dollar increases** of lower incomes to reduce inequality (in the context of economic growth).

# Absolute Growth Incidence Curves Absolute (PPP \$)

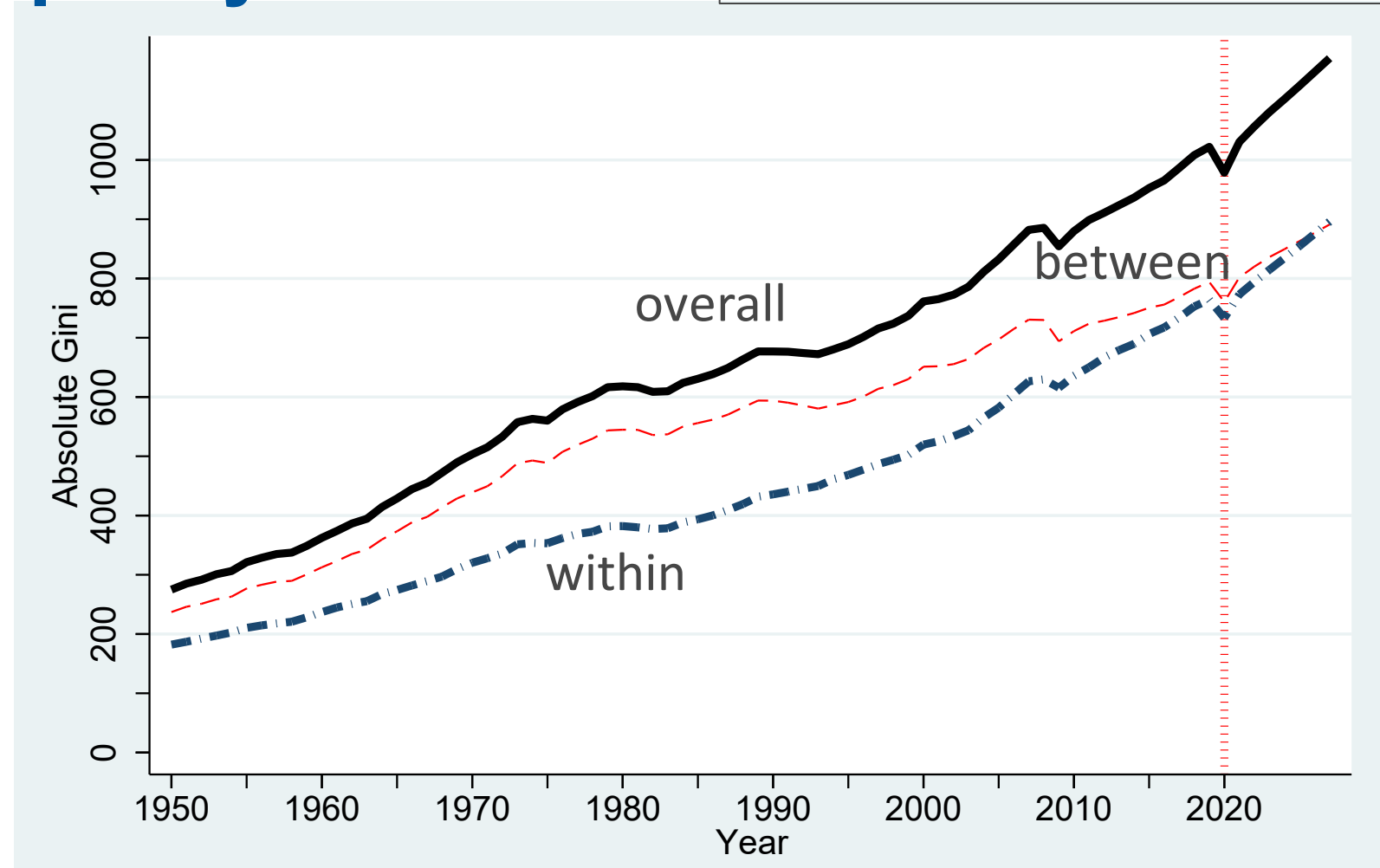
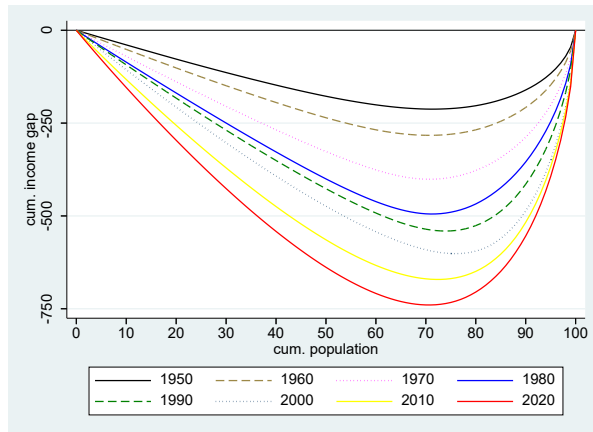




# Absolute inequality

Within → Gradín and Opperl (2021)

## Absolute Gini

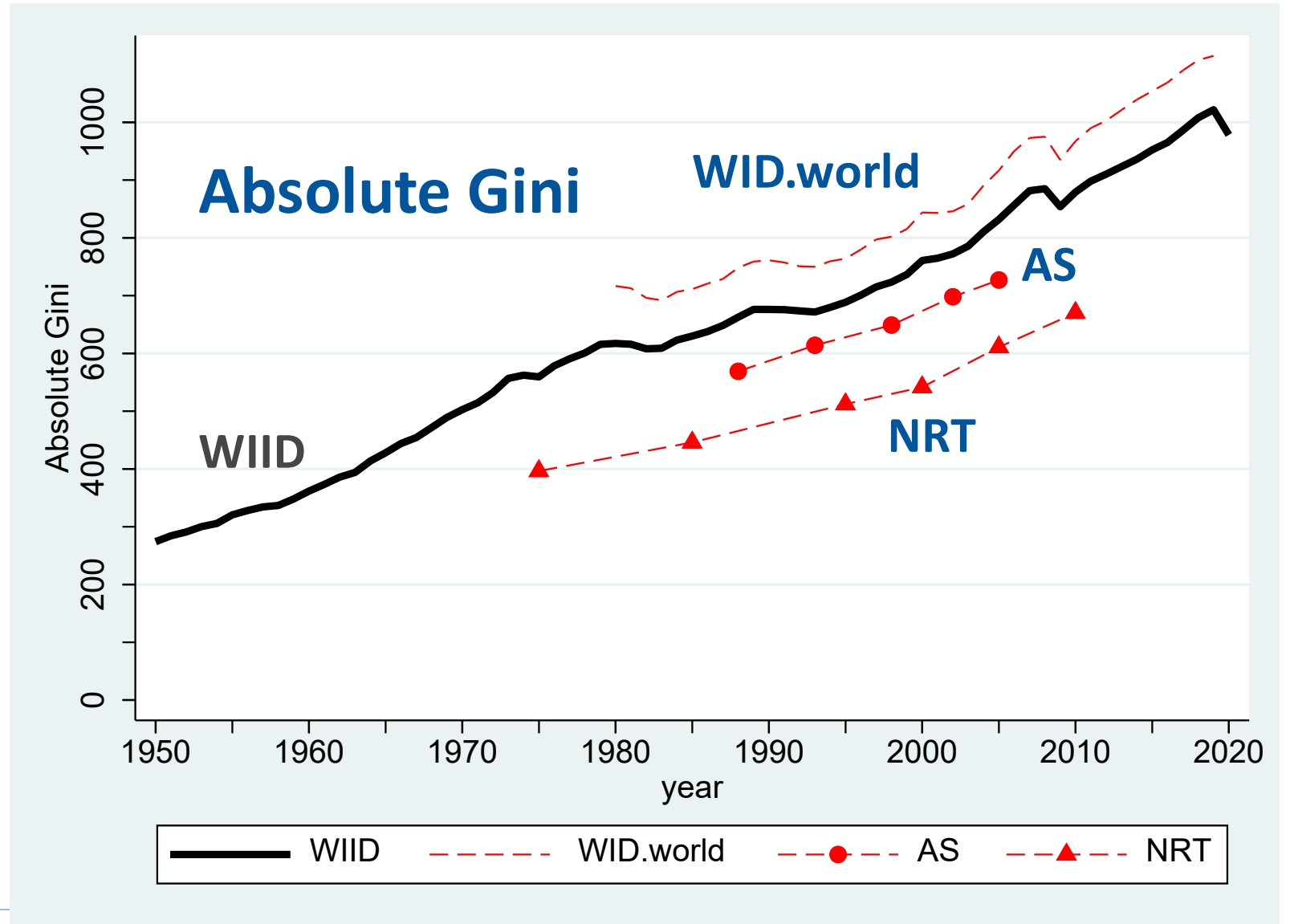


**Increased** over the entire period (1950+) (except recessions, 1974-75, 1980-82, 2008-09).

**General** → overall and between- and within countries.

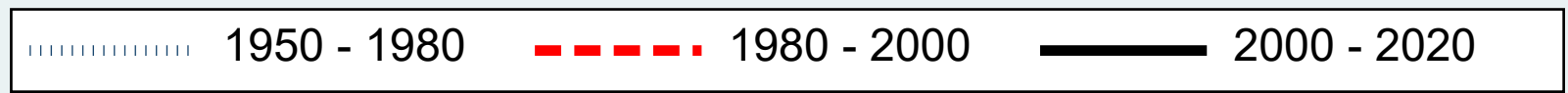
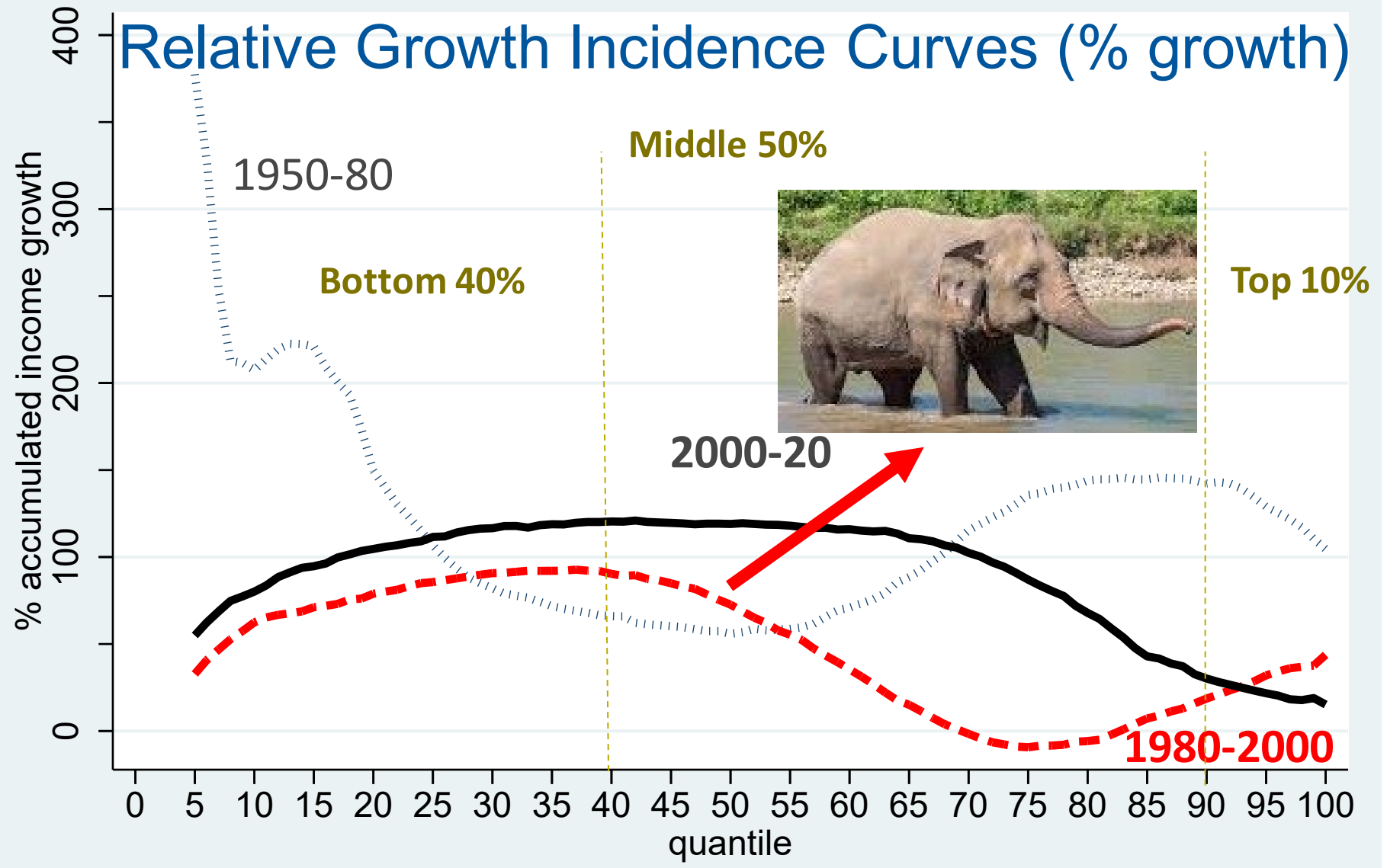
**Lorenz dominance** (e.g., each 10 years).

- **WIID:** UNU-WIDER
- **NRT:** Niño-Zarazúa, Roope and Tarp (2016)
- **AS:** Anand and Segal (2015)
- **WID:** World Inequality Lab



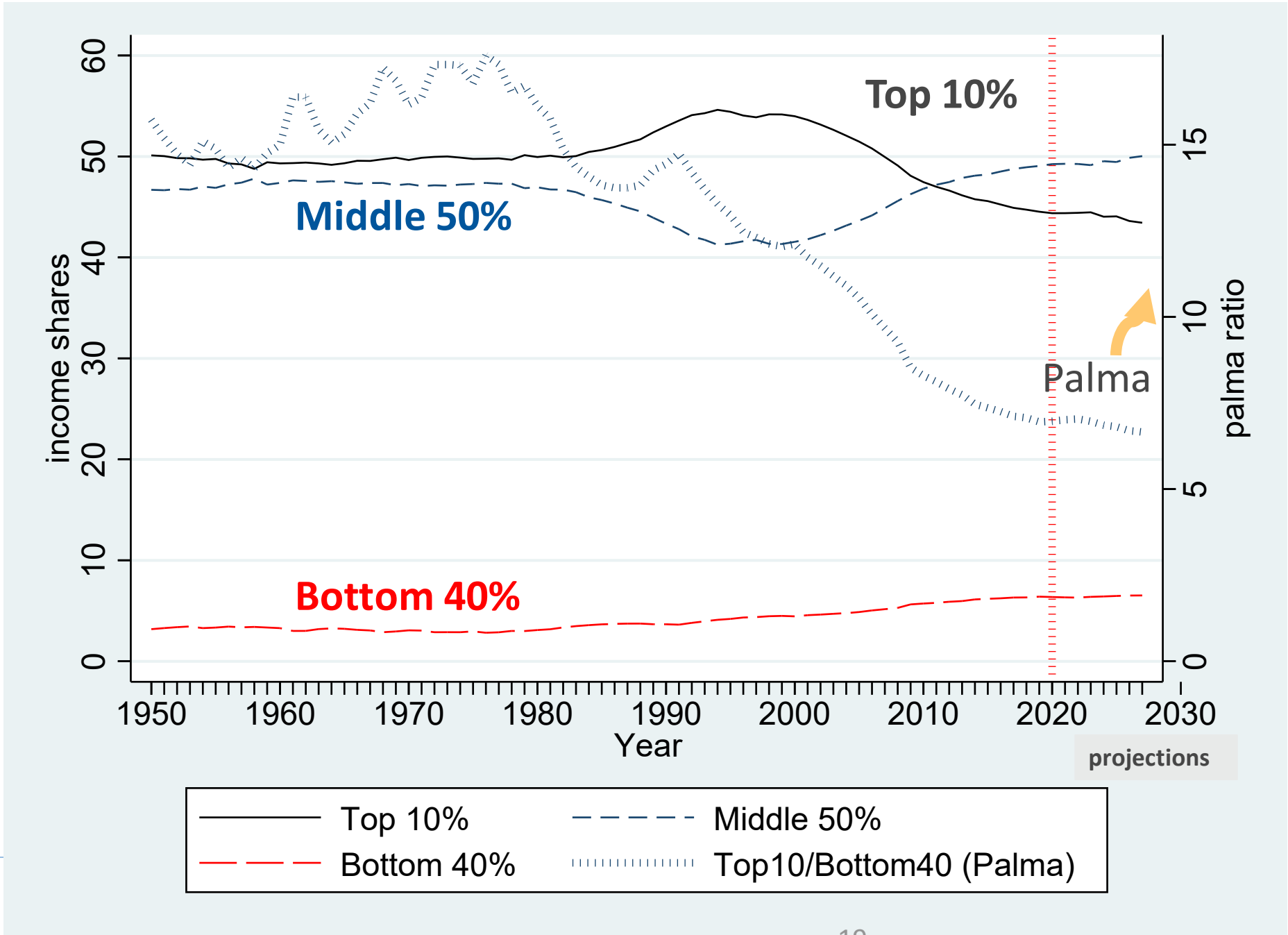
# Trend in relative inequality

- ***Scale invariance***: higher **percentage growth** of lower incomes to reduce inequality.

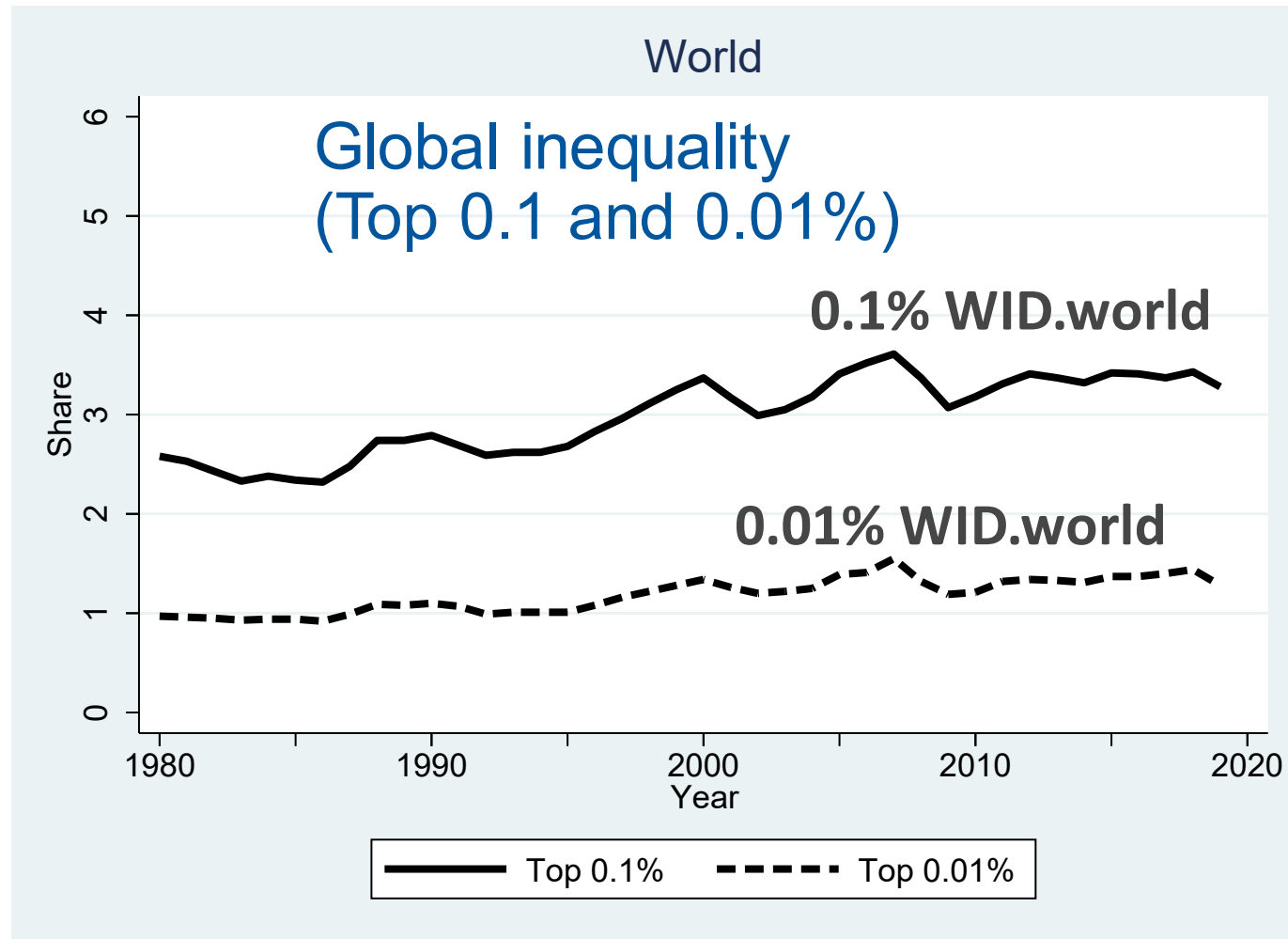


# Global inequality

## Income shares and Palma ratio



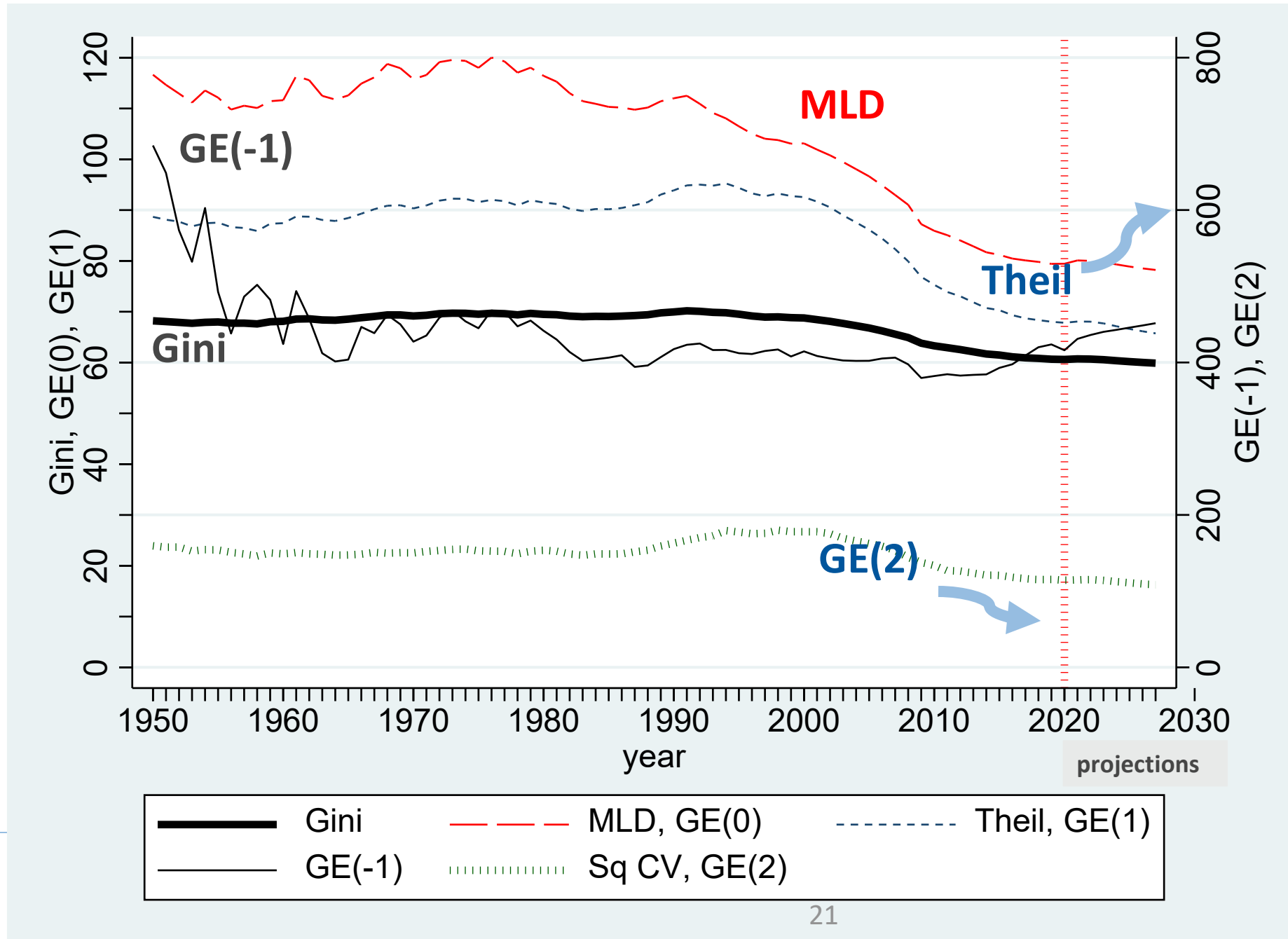
# Top incomes WID (World Inequality Lab)





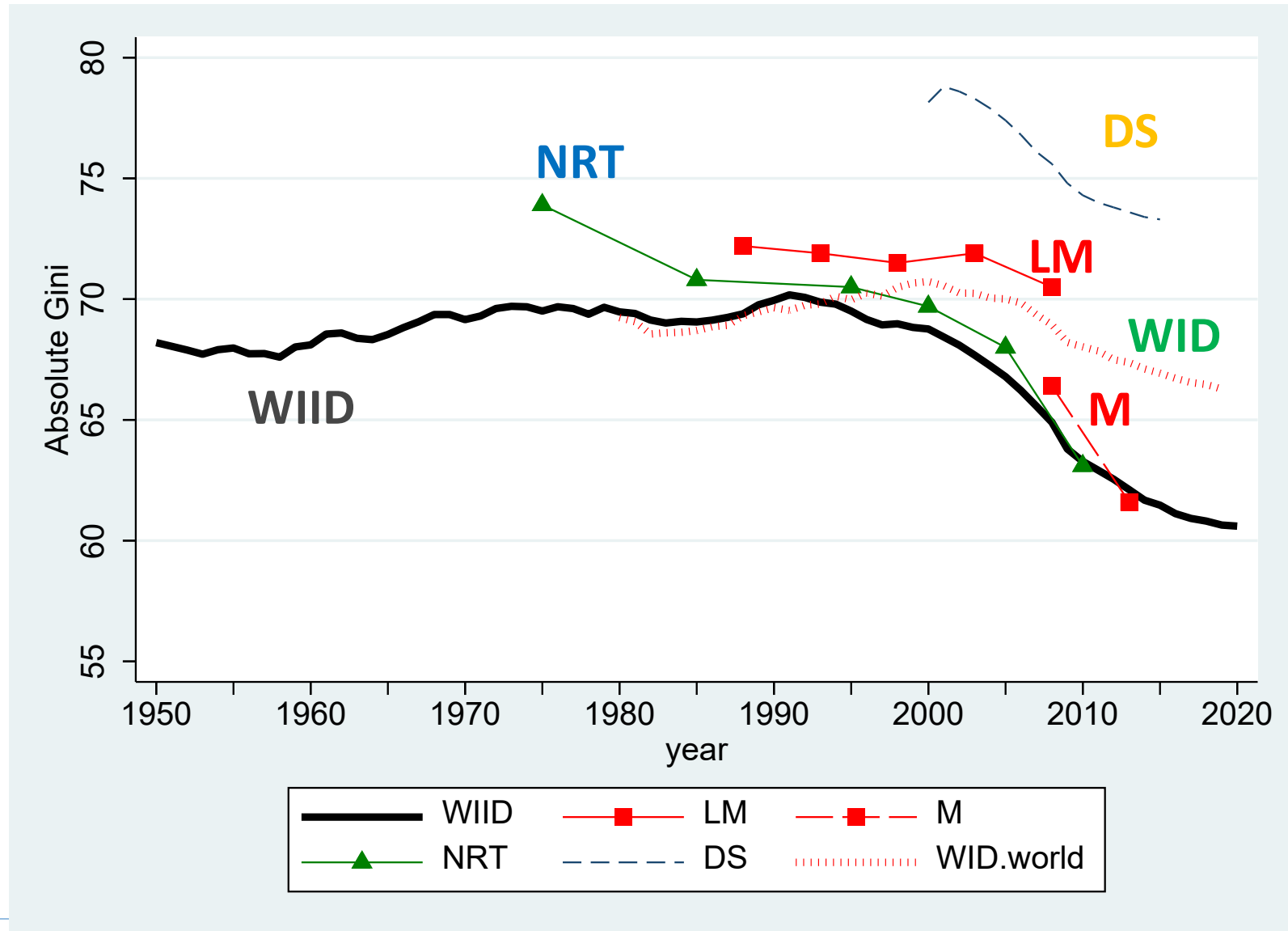
# Indices

**Exception** (noisy):  
extreme sensitivity  
to the **very bottom**  
(e.g.,  $GE_{-1}$ )

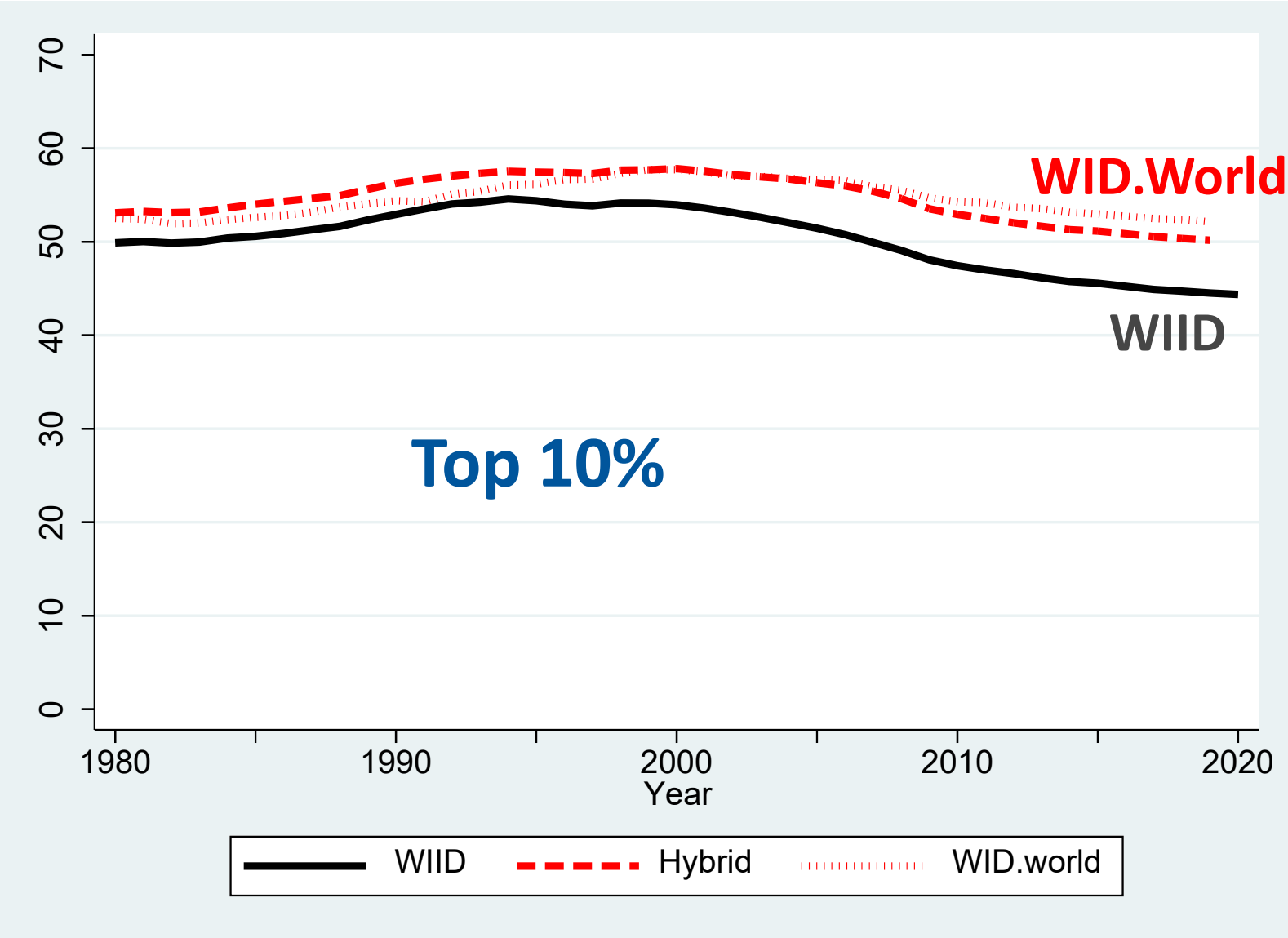


- **WIID: UNU-WIDER**
- **LM:** Lakner and Milanovic (2016) for 1988-2008;
- **M:** Milanovic (2021) for 2008-13
- **NRT:** Niño-Zarazúa, Roope and Tarp (2016) for 1970-2010
- **DS:** Davies and Shorrocks (2021)
- **WID:** World Inequality Lab

## Gini



# Correcting the WIID with WID top incomes

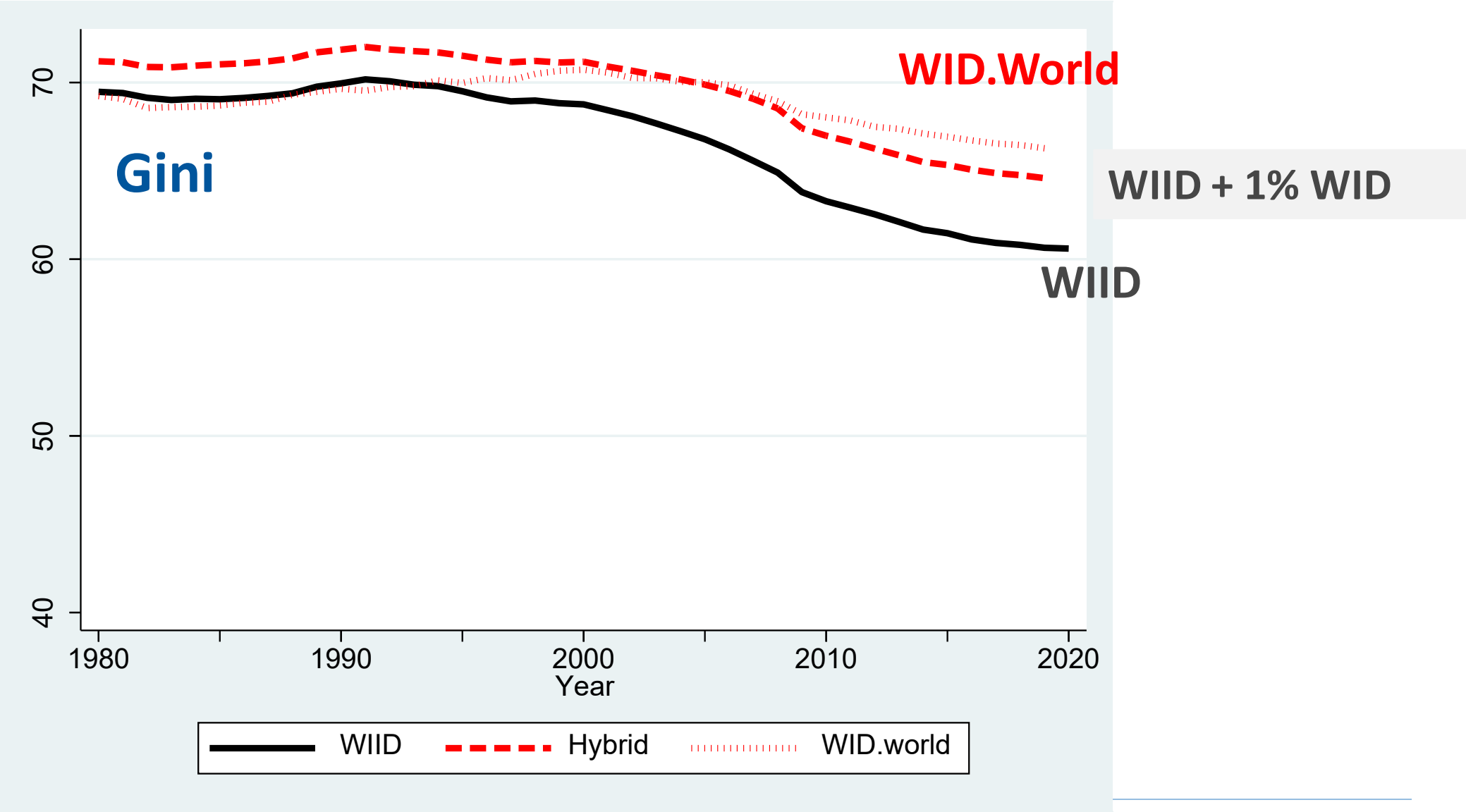


WIID + 1% WID

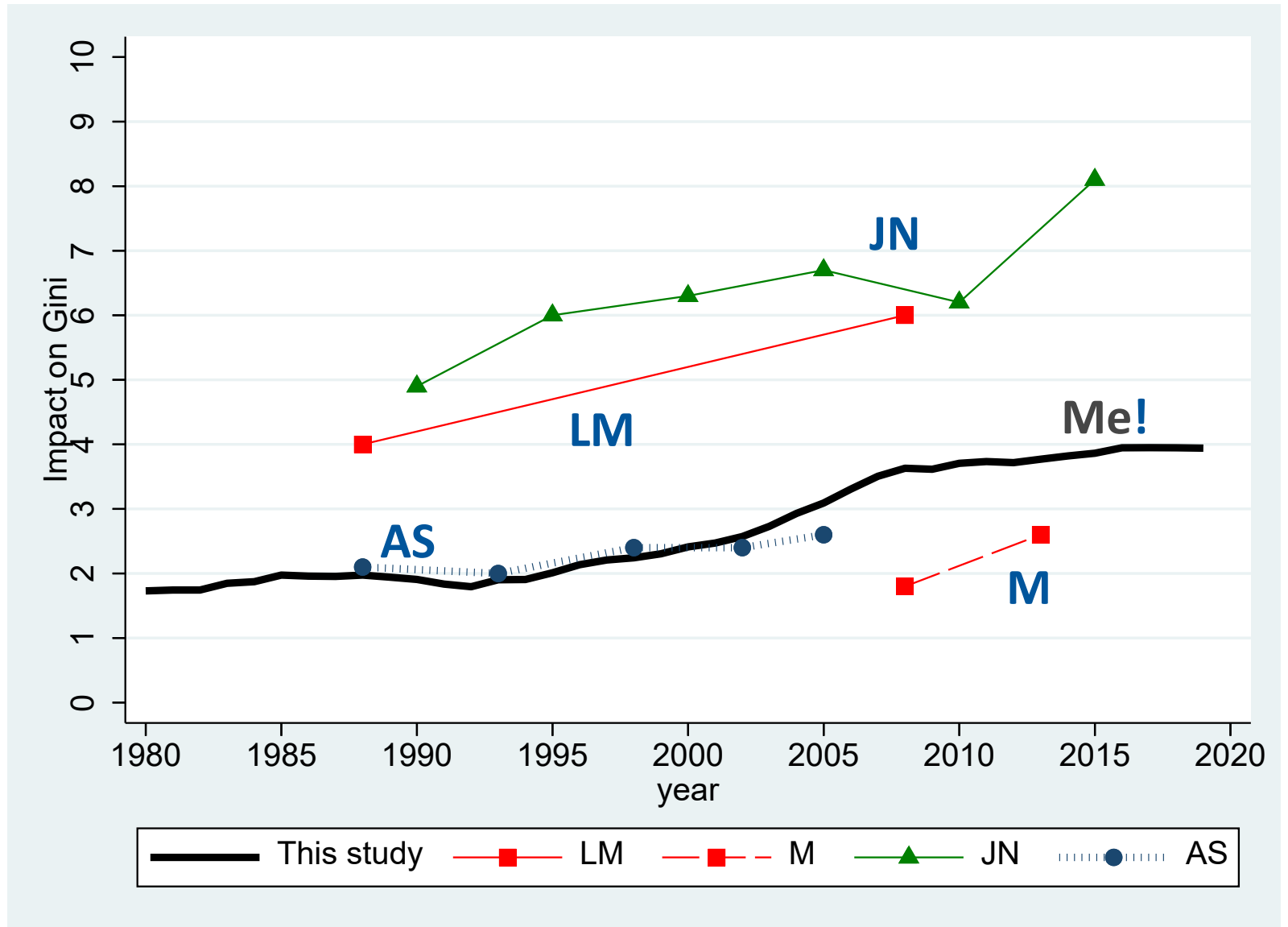
Hybrid distribution:

Replacing top 1% in each country (WIID)

by WID top1% estimates



- **This study**
- **AS:** Anand and Segal (2015)
- **LM:** Lakner and Milanovic (2016) for 1988-2008;
- **M:** Milanovic (2021) for 2008-13
- **JN:** Jordá and Niño-Zarazúa (2019)



# Decomposition

- **Between countries:** after equalizing income within countries

(inequality in the distribution of country per capita income, with countries weighted by population)

- **Within countries:** after equalizing average income between countries.

( $\cong$  population weighted sum of country inequality)

They add up to Overall inequality only with **MLD**

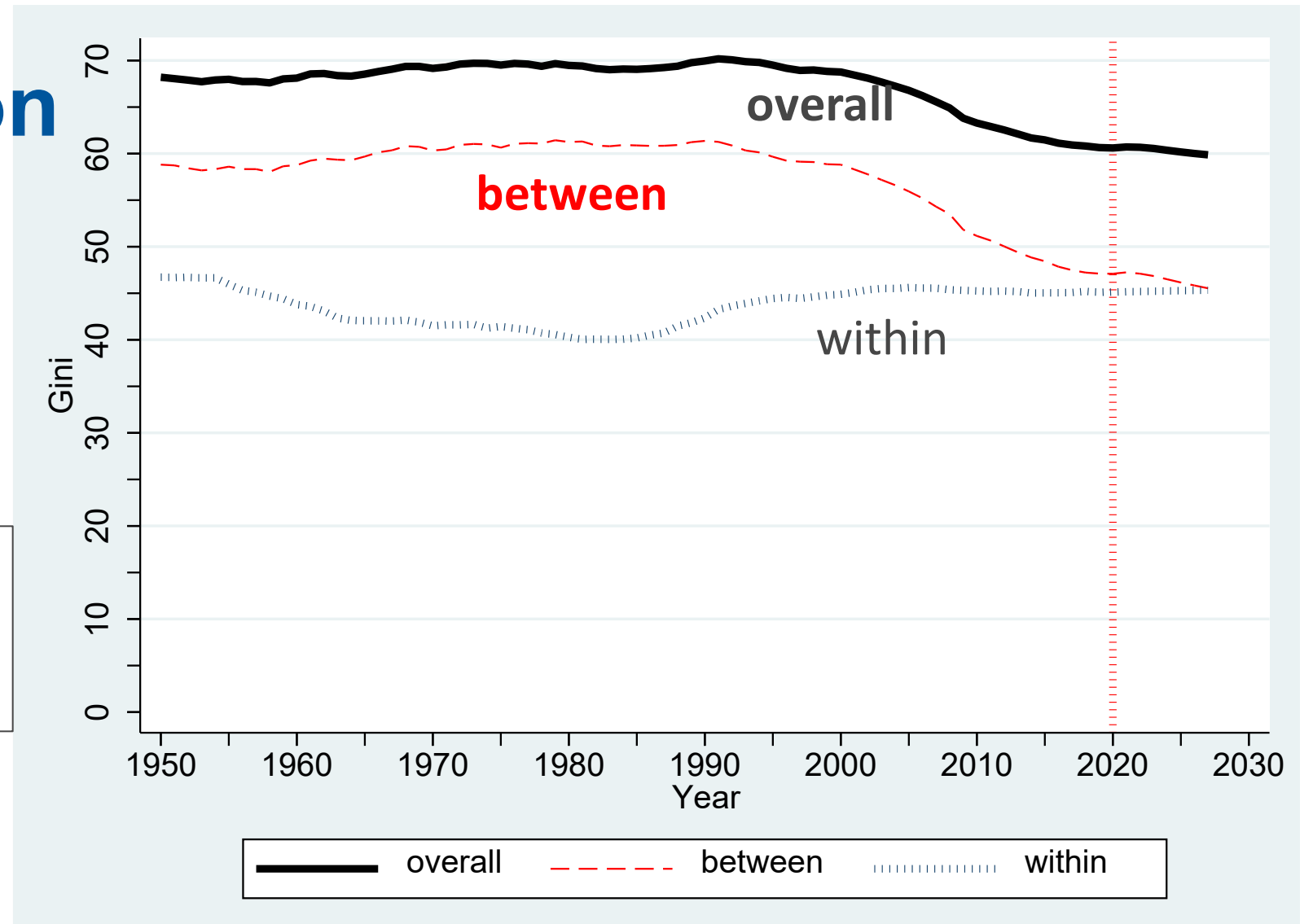
→ + **Shapley** share of between group inequality



# Decomposition

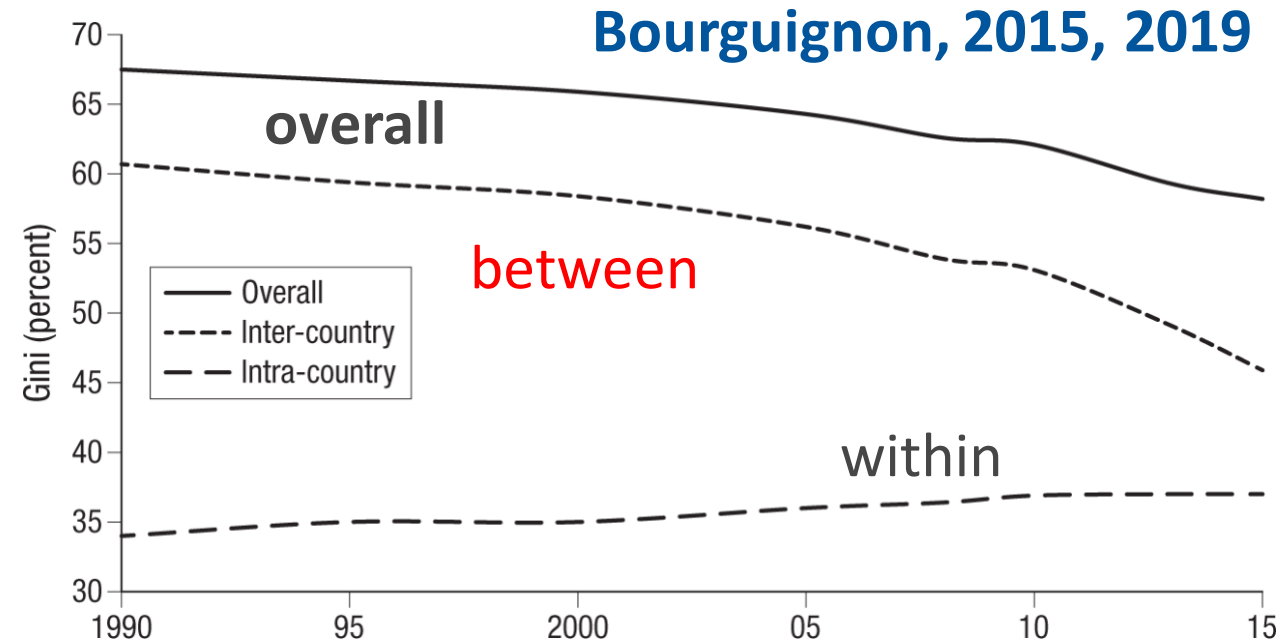
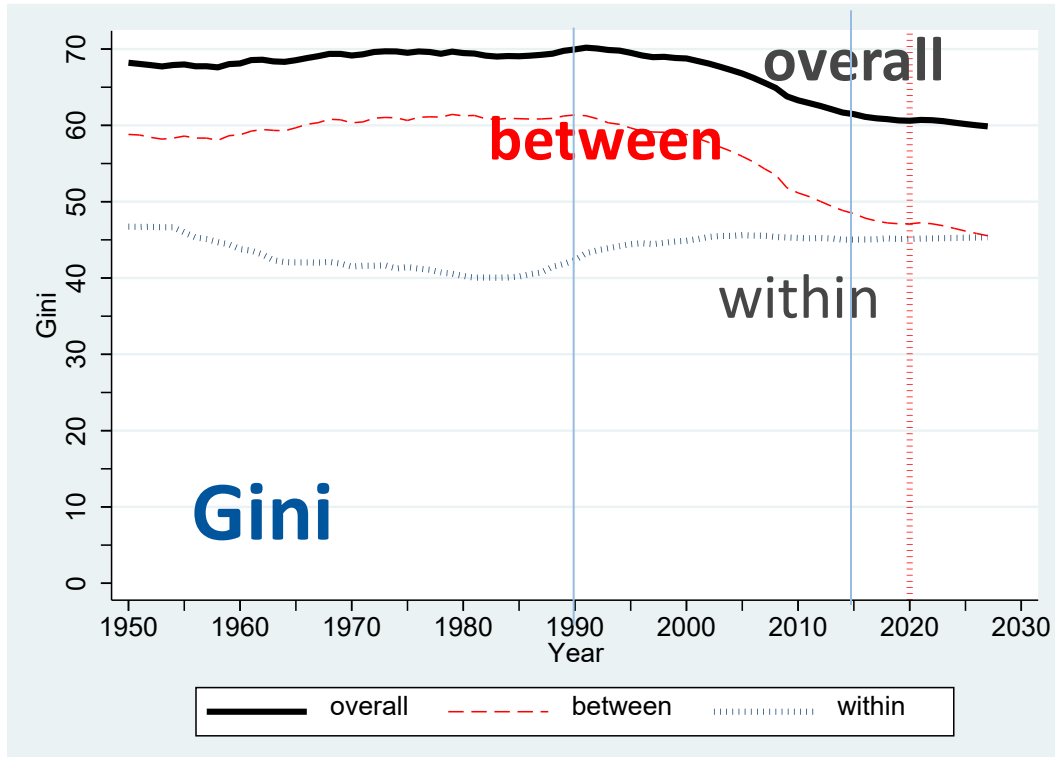
## Gini

Within country (detailed analysis)  
→ Gradín and Oppel (2021)



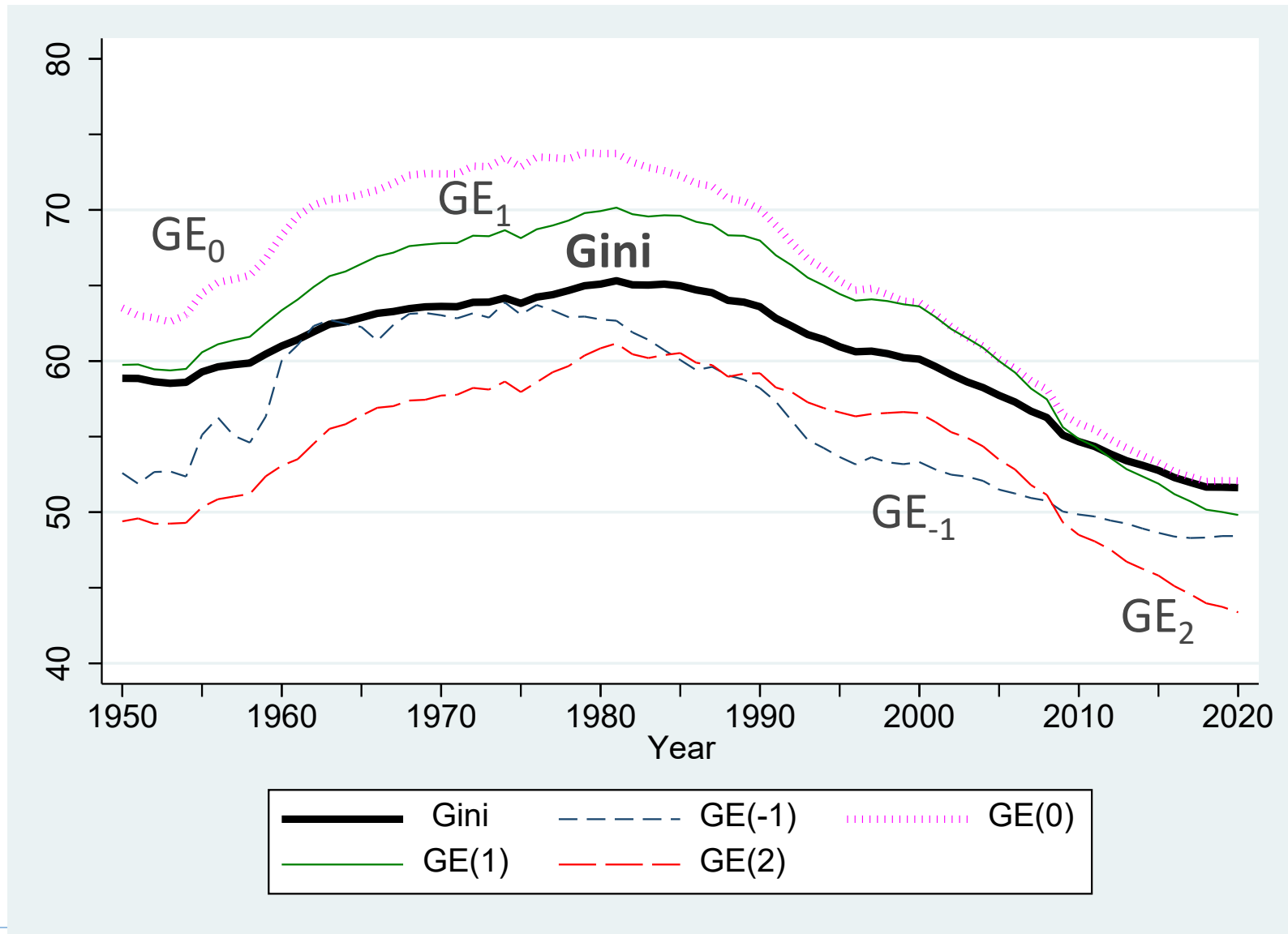
- Inequality trend is driven by **inequality between countries**,  
... (partially) offset by **inequality within countries**

# Decomposition



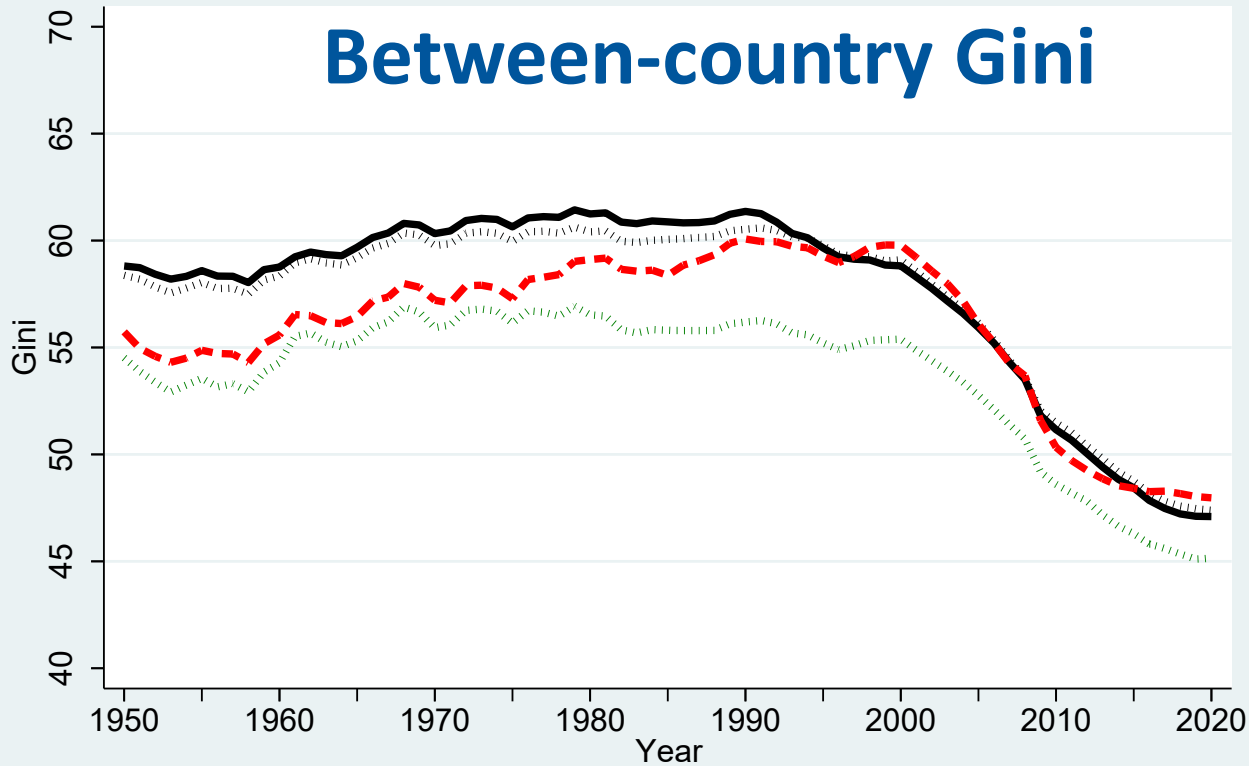
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# Between-country share of inequality (Shapley)



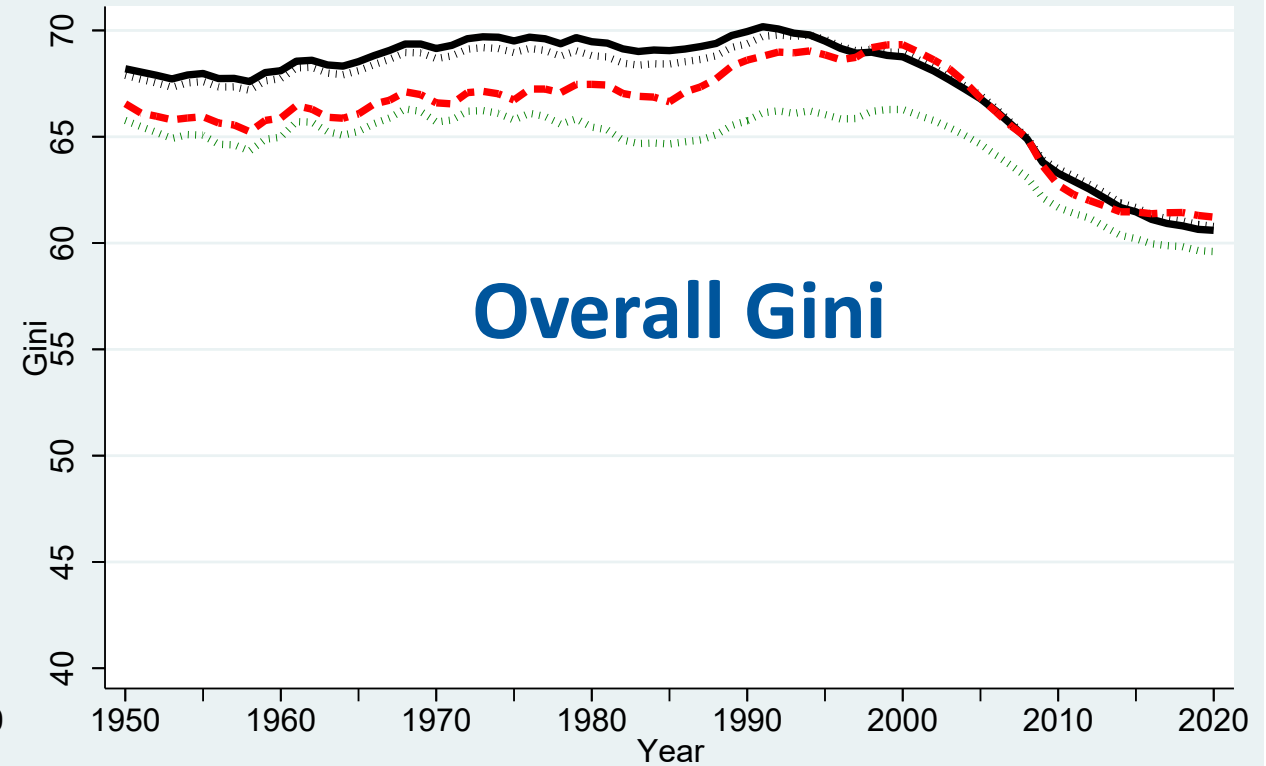
# Robustness, average country income

## Between-country Gini



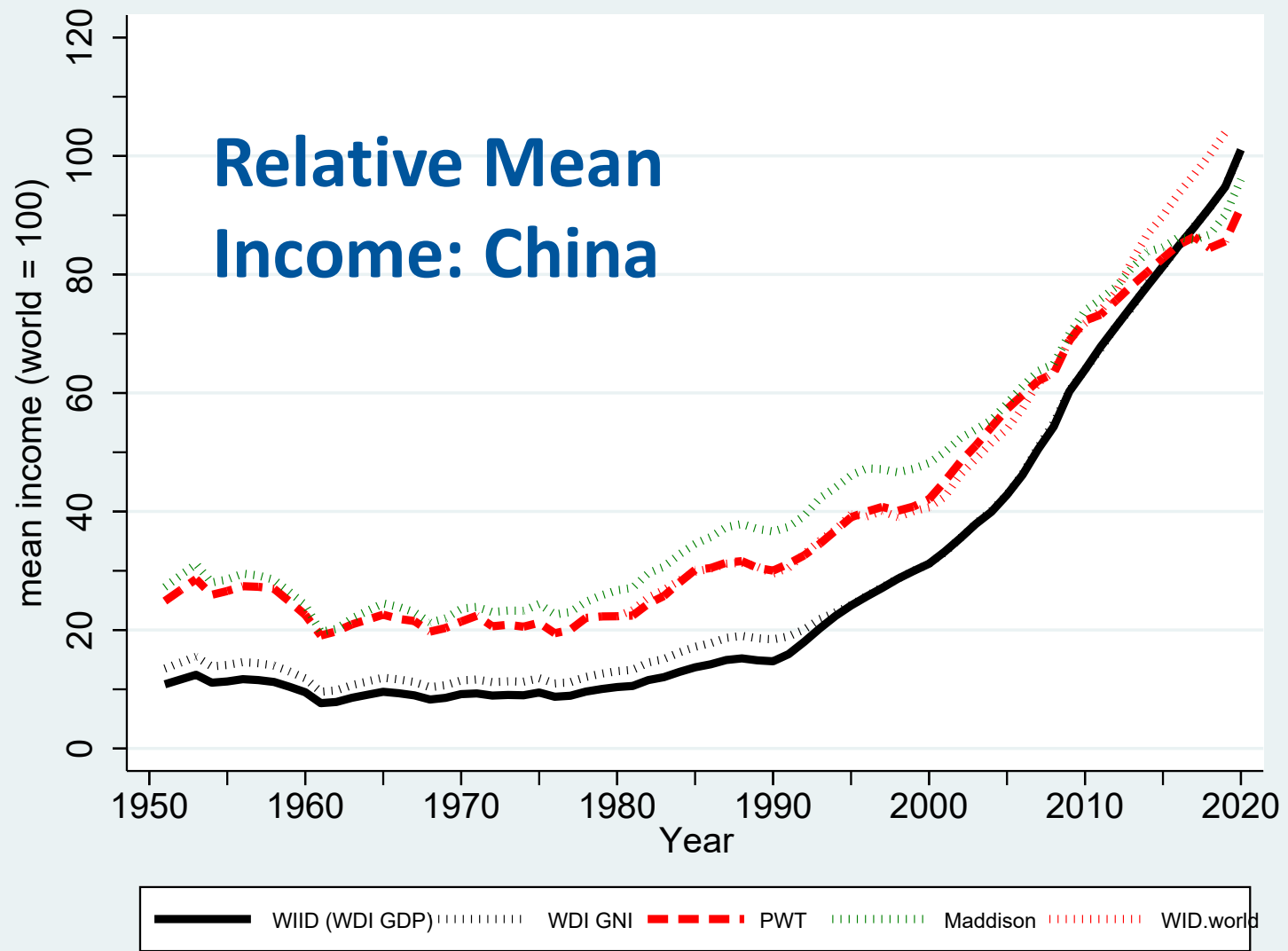
— WIID (WDI GDP) ..... WDI GNI - - - PWT ..... Maddison

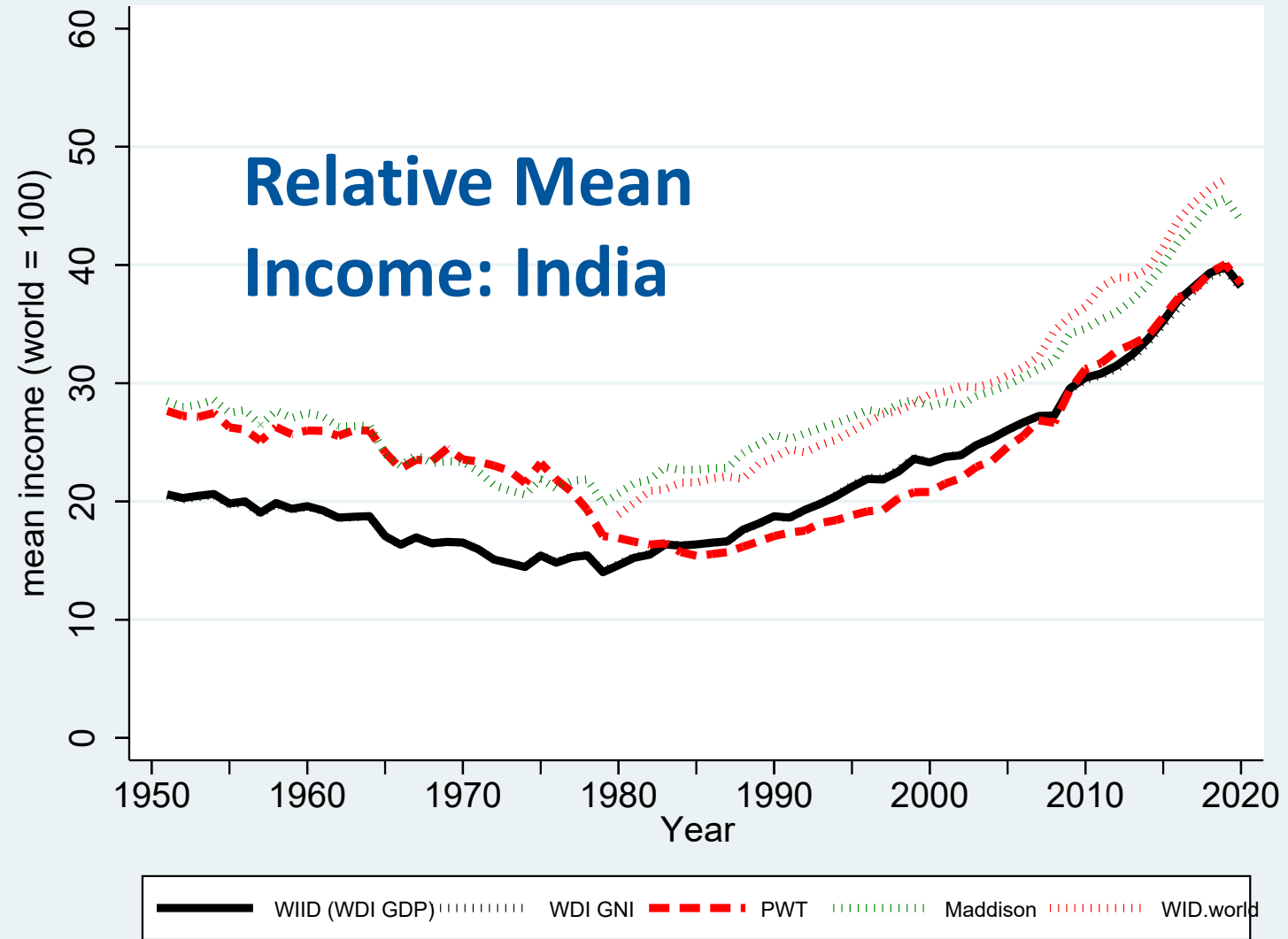
## Overall Gini



— WIID (WDI GDP) ..... WDI GNI - - - PWT ..... Maddison

# Relative Mean Income: China





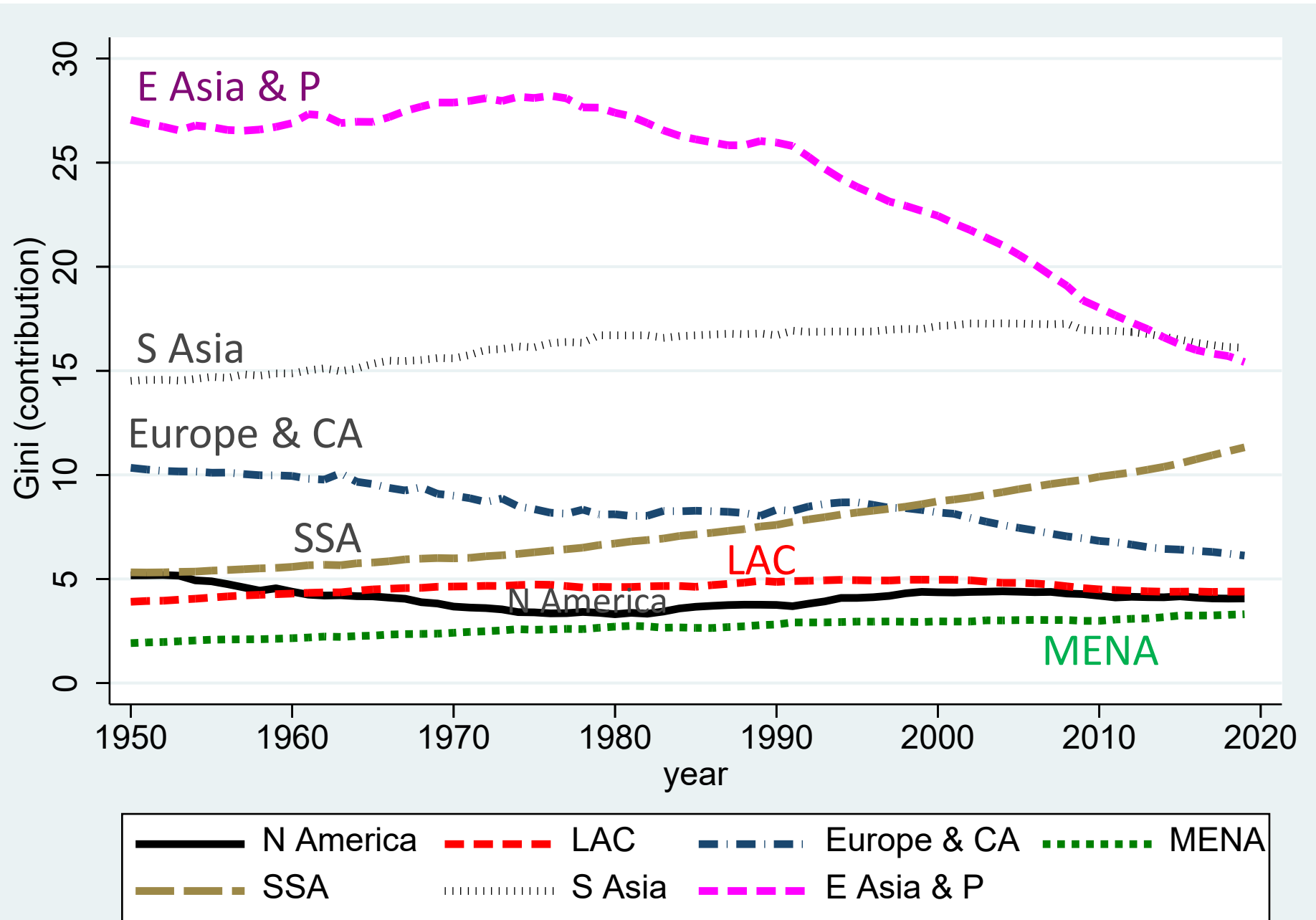
# Country contributions to inequality

- **RIF Decomposition** (Gradín, 2020): Quantifying the contribution of a country or region to:
  - **Overall** inequality and its components:
    - Inequality **between countries**
    - Inequality **within countries**

Country contribution:  
→ Sum of changes in inequality after marginally increasing the share of people at a specific income

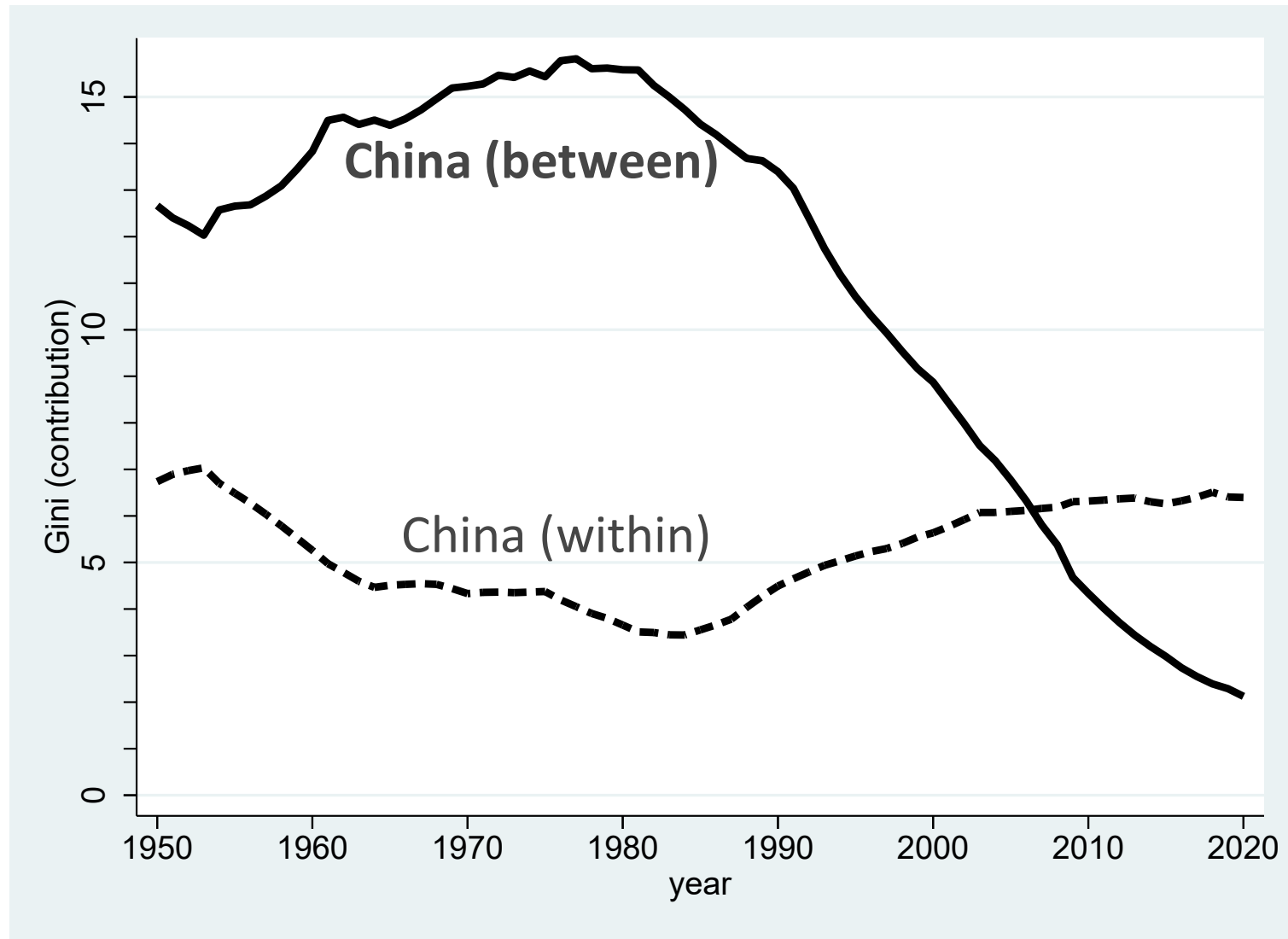
# Contribution to global Gini by Region

(adding up to overall Gini)





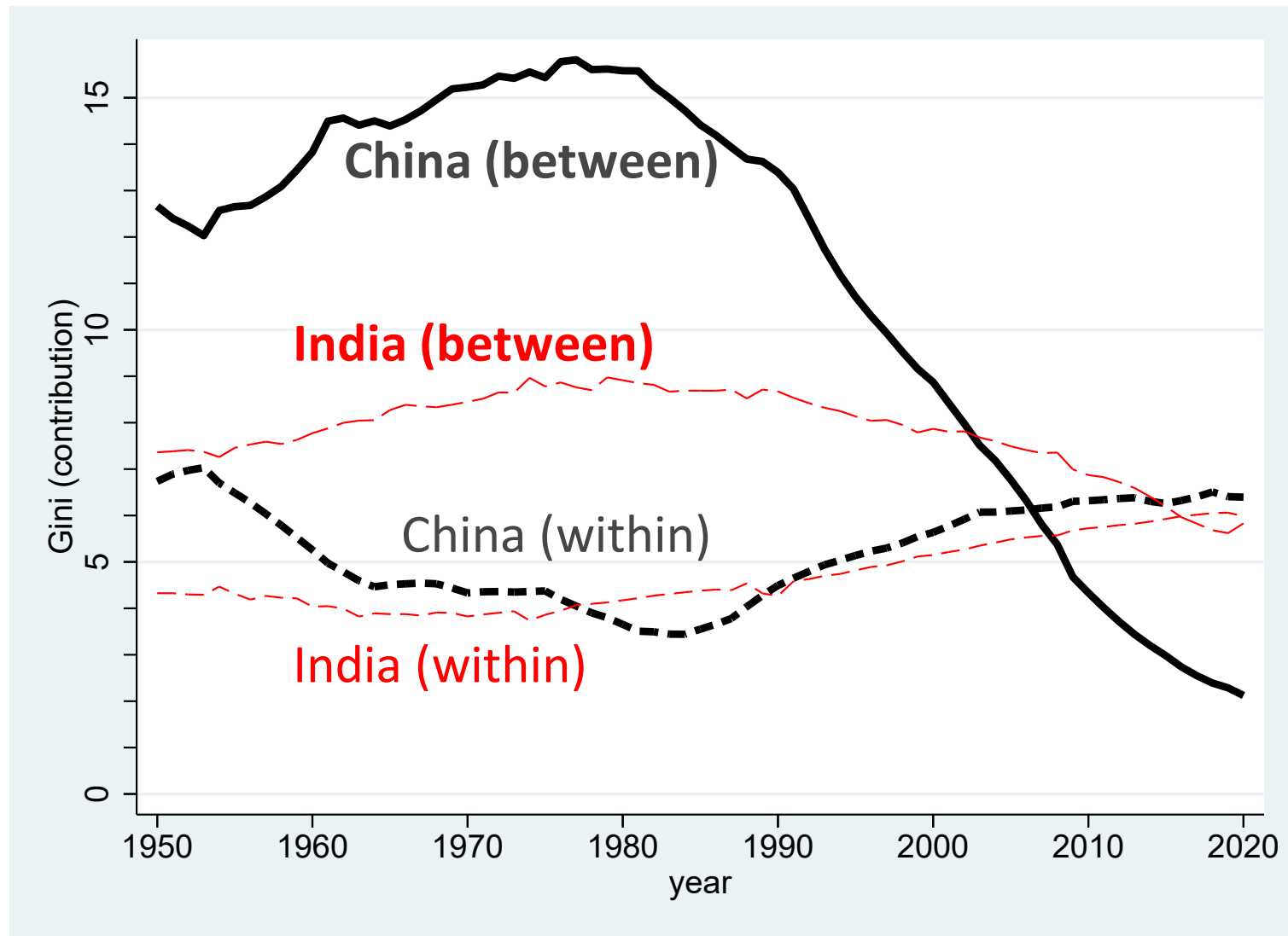
Country  
contribution to Gini  
(adding up to overall  
Gini)



The **main trends** in global inequality (and BC + WC) can be largely explained by the economic evolution of China and, to a lesser extent, India.

Roles of BC and WC reversed → changing the overall trend.

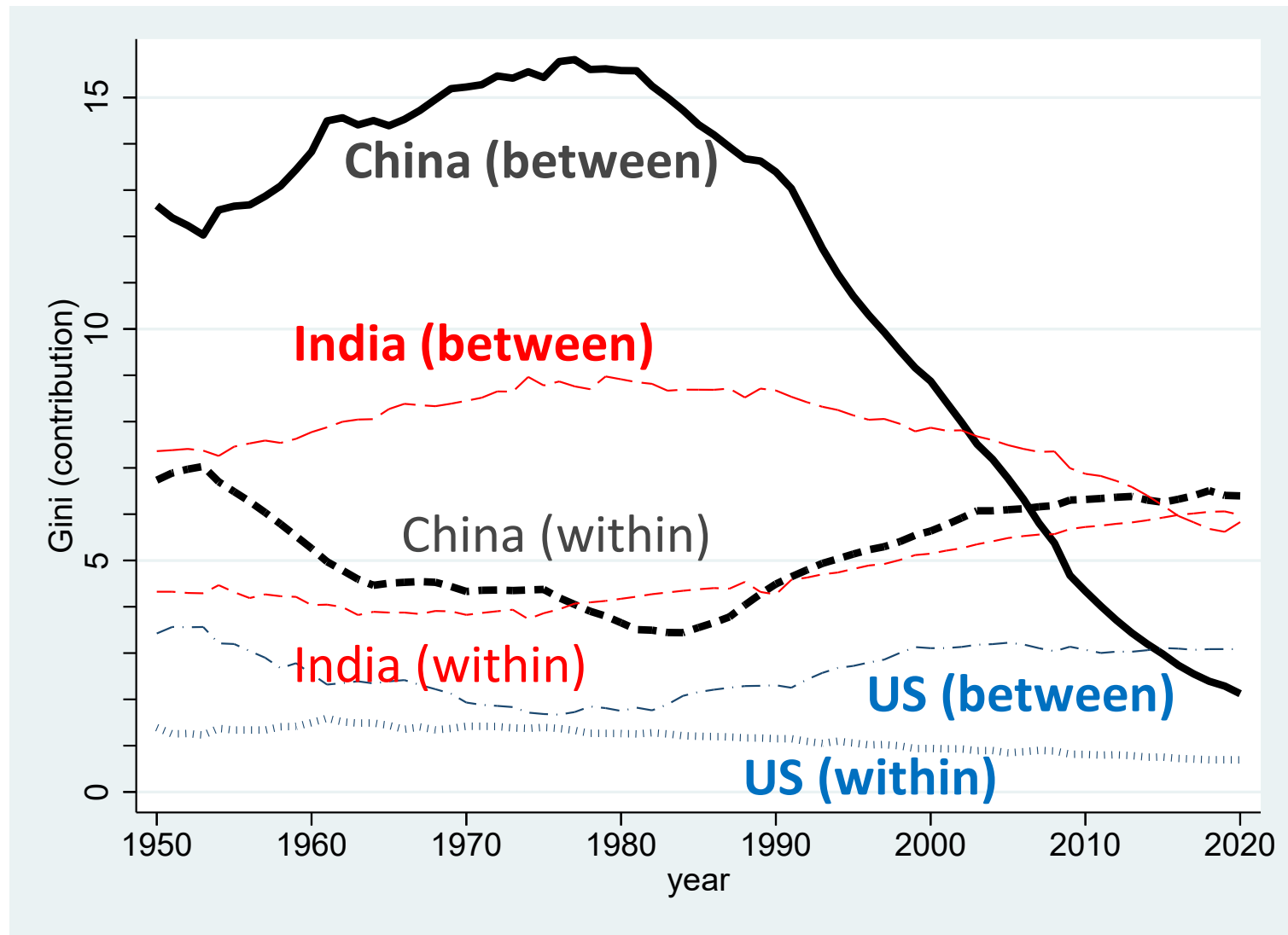
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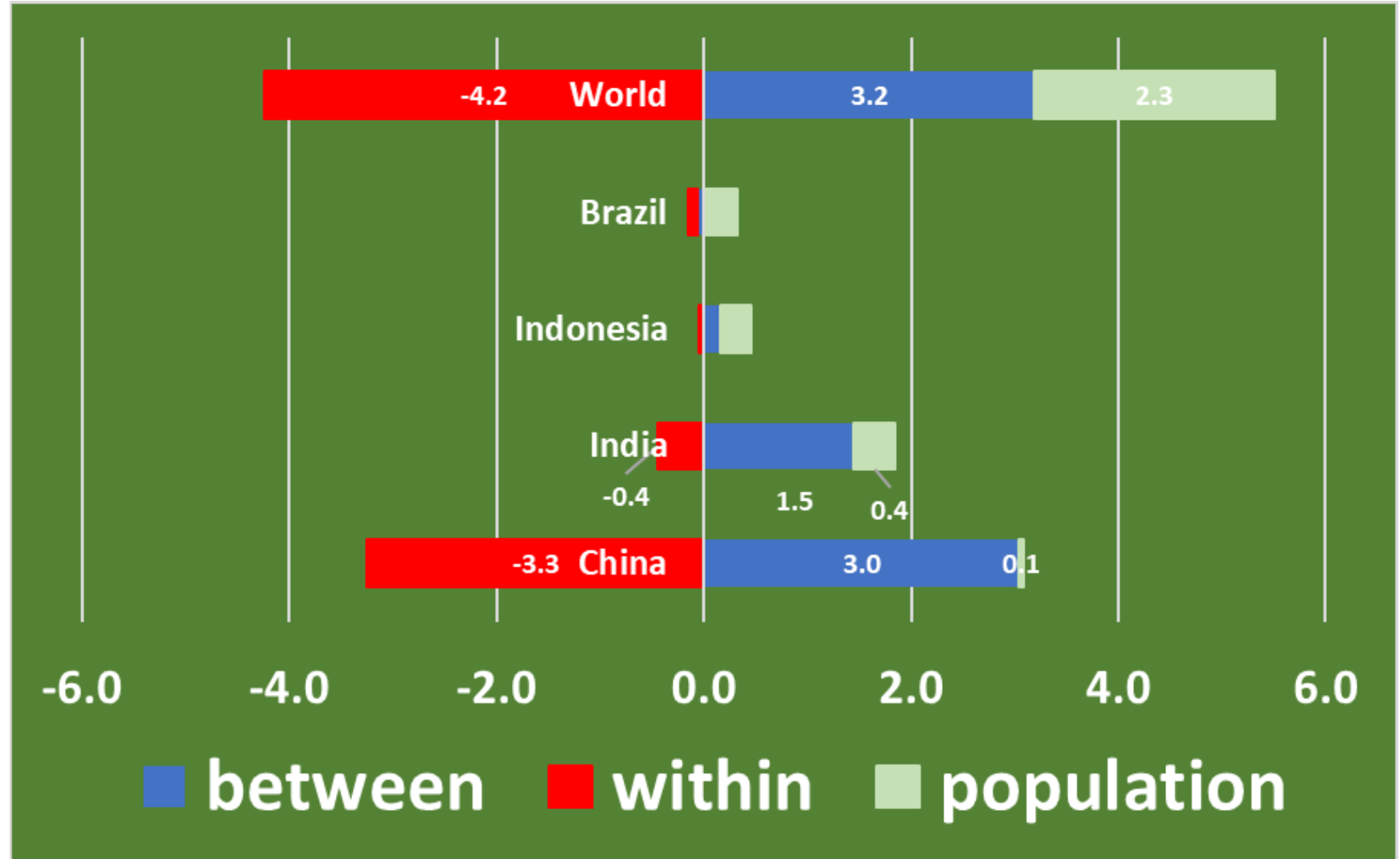
Roles of BC and WC reversed → changing the overall trend.

# Country contributions to inequality trend

- **Decomposition** (OB-type based on the RIF): Quantifying the contribution of a country or region to the change in **overall** inequality through ... :
  - Inequality **between countries** (with constant population).
  - Inequality **within countries** (with constant population).
  - **Population growth** (with constant income distributions).

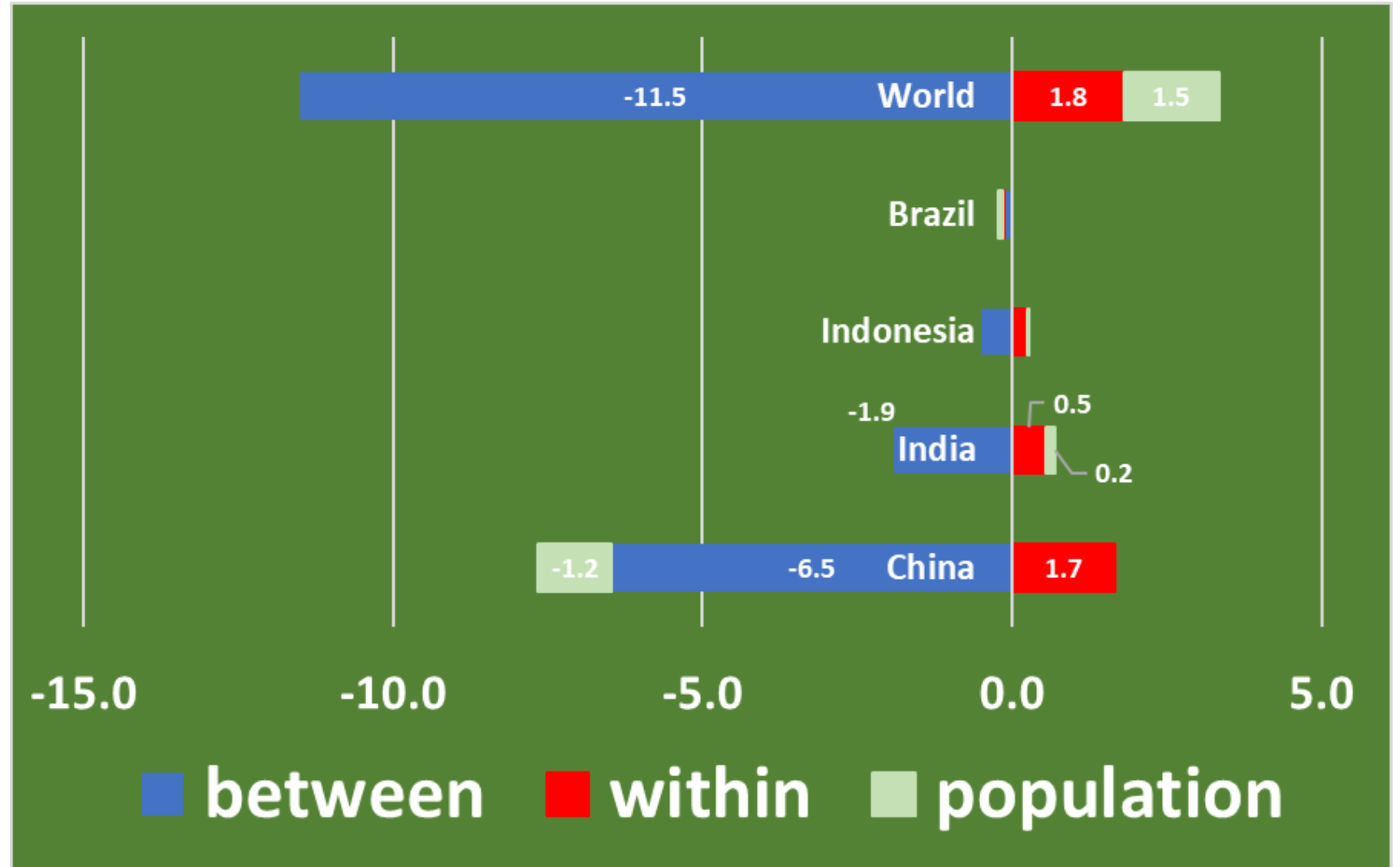
# Contribution to Gini change by component and country 1950-80

Increase:  
**1.3** Gini points



# Contribution to Gini change by component and country 2000-20

Fall:  
**-8.2** Gini points



# Country contributions

- **Other factors:**
  - Contribution of former socialist **E Europe** during the transition
  - **Diverging inequality trends** in various regions in recent years.
  - Impact of faster **population growth** in Sub-Saharan African region.

# Concluding remarks

- Work-in-progress **global inequality database** that reflects trends as they would be obtained from standardized household survey.
  - Help **monitoring** inequality trends and drivers in a transparent and flexible way,
    - Not imposing a particular inequality approach (relative and absolute; entire distribution and measures with different sensitivity).
  - **Robustness:**
    - Alternative approaches to country per capita living standards: key for the 1980s and 1990s.
    - Correction of top incomes: higher inequality, similar trend (except very top).





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**THANKS!!!!!!**